DOCUMENT RESUME

ED 045 716 TM 00C 290

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TITLE Multiple Prediction Studies. Final Report.

INSTITUTION Washington Univ., Seattle.

SPONS AGENCY Office of Naval Research, Washington, D.C. Personnel

and Training Research Programs Office. Jun 70

PUB DATE Jun 70 NOTE 16p.

EDRS PRICE EDRS Price MF-\$0.25 HC-\$0.90

DESCRIPTORS Classification, *Data, *Factor Analysis, Measurement

Techniques, Models, *Personal Adjustment,
*Prediction, Predictor Variables, *Research

Methodology, Statistical Analysis

AESTRACT

This final report indicates the general areas of investigation in a program of research in the prediction of personal adjustment, conducted over a seventeen-year period. The crucial problems in the prediction of personal adjustment are fundamentally concerned with the data matrix which reflects the experimental designs and displays the essential information from the experimental observations. The research program has been primarily concerned with methodological aspects of these problems, but the techniques have also been applied to substantive data. A comprehensive bibliography records 3 theses, 47 technical reports, 26 journal articles, 8 monographs, 4 book chapters, and 4 books which have resulted from this research. (Author/CK)



FINAL REPORT MULTIPLE PREDICTION STUDIES

Paul Horst

This research was sponsored by the Personnel and Training Research Programs, Psychological Sciences Division, Office of Naval Research, under Contracts 477 (08 and 33), Project NR 151-143.

Principal Investigator: Paul Horst
University of Washington
June 1970

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(Security classification of title, body of abstract and indexing	annotation must be e						
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University of Weshington Seattle	Woch	Unclassified					
University of Washington, Seattle, Wash.		2b. GROUP					
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Final Report - May. 1953 through February 1970 5 AUTHOR(S) (First name, middle initial, last name)							
Paul Horst							
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6. REPORT DATE	78. TOTAL NO. 01	PAGES	7b. NO. OF REFS				
June, 1970	15		125				
88. CONTRACT OR GRANT NO.	98. ORIGINATOR'S REPORT NUMBER(5)						
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11. SUPPLEMENTARY NOTES	12. SPONSORING N						
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	Office of Naval Research						
13. ABSTRACT							

This Final Report indicates the general areas of investigation in a program of research in the prediction of person adjustment, conducted over a period of seventeen years. The research, under the title of "Multiple Prediction Studies," was supported by Project NR 151-143, Contracts Nonr-477 (08 and 33), Office of Naval Research. The publications resulting from the research and listed in the bibliography include thirty-six (36) theses, forty-seven (47) technical reports, twenty-six (26) journal articles, eight (3) monographs, four (4) chapters in books, and four (4) books.

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FINAL REPORT MULTIPLE PREDICTION STUDIES

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ACKNOWLEGEMENT

The program of research on which this Final
Report is based was made possible by the continuing
support of the Personnel and Training Branch of the
Psychological Sciences Division of the Office of
Naval Research, U.S. Department of Defense, and the
active interest of successive Heads of the Personnel
and Training Branch--Drs. Denzel D. Smith, Glenn L.
Bryan, and Victor Fields. Very substantial supplementary support was also provided by the U.S. Department of Health, Education, and Welfare.

A major debt of gratitude is due my many competent and loyal students and assistants who are too numerous to mention here but whose names appear in the appended bibliographies.



MULTIPLE PREDICTION STUDIES

This document constitutes the final report on a program of research in the prediction of personal adjustment supported by the Office of Naval Research under Contract Nonr-477 (33), Project NR 151-143, from April, 1962 through February, 1970. This research followed, without a break, a program in the same general area, also supported by the Office of Naval Research under Contract Nonr-477 (08), Project NR 151-143, from May, 1953 through March, 1962.

The crucial problems in the prediction of personal adjustment are, for the most part, fundamentally concerned with the data matrix which reflects the experimental designs and displays the essential information from the experimental observations. The research program has been primarily concerned with methodological aspects of these problems but the techniques have also been applied to substantive data. The research program under the earlier contract was concerned largely with the following major problems:

Predictor selection techniques for multiple criteria
Optimal test length for multiple prediction
Optimal classification
Simplified matrix algebra
Factor analytic technology
Multiple set analysis



The numerous technical reports, M.A. and Ph.D. theses, and published articles and monographs listed in the Final Report for the original contract, and reprinted in this report for convenient reference, provide detailed accounts of the specific research projects in the general areas.

During the current contract period, major effort was continued in the general areas of

Optimal classification
Factor analytic technology
Multiple set analysis
Simplified matrix algebra

In addition to these, research in the following areas was also conducted:

The incomplete data matrix

Rank reduction models for multiple prediction

Configural analysis techniques

Psychological measurement

Non-cognitive measurement

Binary data matrices

Prediction from nonrandom subgroups

Metric in multivariate analysis

Much effort has gone into the completion of the four books, listed in the bibliography, covering and integrating many of the results of the research under this and the previous contract. However, much of the work could not be included in these books and most of it is included in the numerous technical reports, Ph.D. theses, chapters in books, monographs, and published articles listed in



the bibliography.

The vast and highly technical field of prediction of personal adjustment would require a set of many additional volumes to cover adequately the current state of the art. At least one or more additional volumes would be required to set forth in detail the many urgent unsolved problems and to suggest well-indicated directions and areas for further research. This says nothing of the actual prosecution of the needed research.

It is hoped that the principal investigator may continue, even if at a more leisurely pace, to contribute to one or more of these three areas: (1) the orderly presentation of the current state of the art, (2) the outlining of further needed research, and (3) actual participation in this research. He rests assured, however, that many others with a longer productive life expectancy will continue to contribute in these three areas.



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